## Mathematics of eye

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28.10.2013

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- Tonometry and other ways of measuring IOP.
$\square$ IOP is determined in almost every eye examination.
$\square$ Keeping IOP in proper bounds is very important: too large $\rightarrow$ glaucoma, too small $\rightarrow$ hypotony.
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- What is the shape of the cornea?


## Eye anatomy



Typical sizes:

- eye size 24 mm ,
- corneal diameter 11.5 mm ,
- corneal thickness $0.5-0.7 \mathrm{~mm}$,
- height circa 2 mm .

Five layers of the cornea:

- epithelium,
- Bowman's layer,
- stroma,
- Descement's membrane,
- endothelium.


## Eye anatomy



Cornea is very important - it accounts for about $\frac{2}{3}$ eye power!

## Tears and their meaning



- They moisten the eye and protect from bacteria.
- Contents: water, salt ( NaCl ) and enzymes.

- Three layers: lipid $0.1-0.2 \mu \mathrm{~m}$, aqueous


## Blinking and the physics

- Blinking brings the tear film over the surface of the cornea.
- Typical time between successive blinks in a healthy patient - about 5-8s (in rabbit's eye - 10min!).
- Problems: too small tear production, too fast evaporation $\rightarrow$ "dry eye".

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- Problems: too small tear production, too fast evaporation $\rightarrow$ "dry eye".
- Some of the physical properties.
$\square$ Lipid layer protects from excessive evaporation. Average evaporation rate is $15 \times 10^{-6} \mathrm{~kg} \mathrm{~m}^{2} \mathrm{~s}^{-1}$ for normal eyes and $60 \times 10^{-6} \mathrm{~kg} \mathrm{~m}^{2} \mathrm{~s}^{-1}$ for dry eyes.
$\square$ This layer also weakens the surface tension: tear-air $-43.3 \mathrm{mN} \mathrm{m}{ }^{-1}$, water-air $-72.3 \mathrm{mN} \mathrm{m}^{\mathbf{- 1}}$.
$\square$ Tear film is slightly shear thinning - viscosity diminishes with the increase of shear stress.
$\square$ In modeling it is usually assumed that tear is a Newtonian fluid and takes into account several factors: surface tension, gradients in lipid layer, evaporation, blinking, heat source and corneal geometry [1]

[^1]
## Interlude: thin layer approximation

- So-called "Lubrication Theory": Reynolds problem on bearing oiling.
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- We scale the unknowns:

$$
\epsilon=\frac{H_{0}}{L}, u^{*}=\frac{u}{U}, v^{*}=\frac{v}{\epsilon U}, t^{*}=\frac{t}{L / U}, p^{*}=\frac{p}{\mu U L / H_{0}^{2}}, R e^{\prime}=\epsilon^{2} \frac{U L}{\nu}
$$

$x$ th component of the nondimensional Navier-Stokes equation then becomes (dropping asterisks):

$$
\frac{\partial u}{\partial t}+u \frac{\partial u}{\partial x}+v \frac{\partial u}{\partial y}=\frac{1}{R e^{\prime}}\left(-\frac{\partial p}{\partial x}+\epsilon^{2} \frac{\partial^{2} u}{\partial x^{2}}+\frac{\partial^{2} u}{\partial y^{2}}\right)
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- Using the continuity equation we obtain Reynolds equation:

$$
\frac{d}{d x}\left(h^{3} \frac{\partial p}{\partial x}\right)=6 \frac{\partial h}{\partial x}
$$

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- Model: thin-layer theory ( $\epsilon=d / I=x$-dimension / $y$-dimension) for Navier-Stokes + evaporation and gravity.


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- Typical scales:

$$
d=10 \mu \mathrm{~m}, I=0.36 \mathrm{~mm}, \epsilon=0.028, G=0.75, U=0.75 \mathrm{mms}^{-1}, \operatorname{Re}=0.2
$$

- Main equation for the tear thickness:

$$
h_{t}+\frac{E}{J_{0}^{-1}+h}+\left[\frac{h^{3}}{12}\left(h_{x x x}+G\right)\right]_{x}=0
$$

where $E, J_{0}$ - constants associated with evaporation and temperature.

[^2]
## Break-up time (BUT) c.d.

- Braun and Fitt obtained a numerical solution on a 4000 point-grid. For the BUT they took the time when $h$ became smaller that grid-size.



## Flows in eye chambers

- Anterior chamber - a region between iris and the cornea. Posterior chamber region between iris and lens.
- Aqueous humor - a fluid that fills the chambers (about $0.3 \mathrm{~cm}^{3}$ ). It removes the products of metabolism, nourishes and provides IOP.
- It is transparent and jelly-like. It consists of water and amino acids.
- It is produces by ciliary body, from where it flows through posterior chamber, pupil and is removed in the Schlemm's canal.
- It must be conserved (!) - same amount removed as produced.

- How to describe it mathematically?


## Flows in eye chambers cont'd.

- What causes the flow of aqueous humor? [3,4] .
$\square$ Buoyancy is a result of temperature gradient between iris and the anterior chamber.
$\square$ The flow is produced by ciliary body.
$\square$ Influence of buoyancy-gravity in horizontal position (ex. during sleeping).
$\square$ REM phase.

[3] A.D.Fitt, G.Gonzalez, Fluid Mechanics of the Human Eye: Aqueous Humour Flow in the Anterior Chamber 10 $/\left[\begin{array}{l}4 \\ 25\end{array}\right.$


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- The simplest model: Navier-Stokes equations, heat equation + Bussinesq approximation and "lubrication theory".
- It is possible to obtain an exact solution, for example

$$
\psi=-\frac{\left(T_{1}-T_{0}\right) g \alpha z^{2}(z-h)^{2}}{24 \nu h}
$$

[3] A.D.Fitt, G.Gonzalez, Fluid Mechanics of the Human Eye: Aqueous Humour Flow in the Anterior Chamber

## Flows in eye chambers cont'd.

- When patient is asleep, the blood flow does not necessarily balance the temperature gradient.
- A very small flow occurs that is a result of gravity and a minute temperature gradient.
- Facodenesis - lens wibrations caused by head movements.
- These vibrations have to have sufficiently small amplitude in order to provide flawless seeing.
- Fitt and Gonzalez assumed a certain periodical "'pumping"' speed of fluid through the pupil.
- The flow is essentially $3 D$.



## Flows in eye chambers cont'd. (Schlemm's Canal)

[5] Z.Ismail, A.D.Fitt, Mathematical modelling of flow in Schlemm's Canal and its influence on primary open angle, glaucoma

## Flows in eye chambers cont'd. (Schlemm's Canal)

- When the anterior chamber holds too much aqueous humor (ex. when the Schlemm's Canal becomes stucked), the pressure rises.
- POAG (Primary Open Angle Glaucoma) $\rightarrow$ advancing and permanent eye nerve damage $\rightarrow$ blindness.


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- In [5] Authors use the Friedenwald's Law (relation between IOP and eye's volume) and thin-layer theory:

$$
(F L) \quad p_{1}=p_{2} \exp \left(K \ln 10\left(V_{1}-V_{2}\right)\right) .
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- They obtained an equation that describes increase of IOP that is caused by Schlemm's Canal occlusion:

$$
\frac{d p}{d t} \approx K p \frac{d V_{i n}}{d t} .
$$

- This occlusion can cause the IOP to become arbitrarily large $\rightarrow$ glaucoma and blindness.

IOP

13 [6] Markiewitz HH, The so-called Imbert-Fick Law

## IOP

- It provides a proper eye shape.
- Typical IOP: $10-20 \mathrm{mmHg}$. When $I O P>25 \mathrm{mmHg}$ glaucoma can develop (or worse...). When $I O P<10 \mathrm{mmHg}$ detunning of lens and cornea can occur (or worse...).

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- Measuring the actual value of IOP is crucial (but it is very sensitive on ambient conditions). This is the field of Tonometry.
- There are some measuring techniques:
$\square$ from very invasive (during a surgical operation),
$\square$ through invasive, ex. Goldman's Tonometer,
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- Imbert-Fick's "Law" (in reality: Newton's Third Law applied "by force"): IOP = value of force (in grams) needed to flatten a circle with radius of 3.06 mm on the cornea [6].
- Cons: wrong physical basis, not-the-best accuracy especially for high IOP, unpleasant for the patient, ...


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- Cons: wrong physical basis, not-the-best accuracy especially for high IOP, unpleasant for the patient, ...
- A measurement only on the basis of corneal topography?


## What is the shape of the cornea?

Contemporary models of corneal topography:

- The simplest: based on the conical curves - mostly parabolas and ellipses (Helmholtz, 1924) ("statistically" correct).
- Very complicated: based on shell thery and FEM.
- Models based on Zernike Polynomials (1934) - describe aberration. Lately, also Bessel functions are being used [7].
- Real models of eye.


## Survey literature

1. Fowler CW, Dave TN., Review of past and present techniques of measuring corneal topography, Ophthalmic Physiol Opt. 14(1) (1994), 49-58,
2. Lindsay R, Smith G, Atchison D., Descriptors of corneal shape, Optom Vis Sci. 75(2) (1998), 156-8.
3. Y. Mejía-Barbosa, D. Malacara-Hernández, A review of methods for measuring corneal topography, Optometry and Vision Science 78 (2001), 240-253,
[^6]
## A new model

## Main assumptions [8]

- Cornea is a thin membrane (constant surface tension and lack of bending moments).
- Three forces shape the cornea: surface tension, elasticity and a pressure-force.
- In the model we describe the height of the cornea $h$ over some reference plane $\Omega$ (here: a circle).

Equation of the corneal topography (in a nondimensional form)

$$
-\nabla^{2} h+a h=\frac{b}{\sqrt{1+\|\nabla h\|^{2}}} \quad \text { on } \Omega, \quad h=0 \text { na } \partial \Omega,
$$

where $h$-rescaled, $a:=\frac{k R^{2}}{T}$ i $b:=\frac{P R}{T}$ and $k$-elasticity constant, $T$-tension, $P$-intraocular pressure, $R$-typical size of the cornea.

[^7]A direct problem
How, from the knowledge of $a$ and $b$, find the shape of the cornea $h$ ?

- We assume an axial symmetry $h=h(r)$ then $a$ and $b$ have to be constant.
- We solve the problem

$$
-\frac{1}{r} \frac{d}{d r}\left(r \frac{d h}{d r}\right)+a h=\frac{b}{\sqrt{1+h^{\prime 2}}}, \quad 0 \leq r \leq 1, h^{\prime}(0)=0, h(1)=0
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\end{equation*}
$$

- For sufficiently small $b$ we have existence, uniqueness, monotonicity and fundamental estimates of (1) by

$$
h_{0}(r):=\frac{b}{a}\left(1-\frac{l_{0}(\sqrt{a} r)}{I_{0}(\sqrt{a})}\right),
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- For small values of $a$ the solution (1) is a parabola.


## Direct problem cont.

Theorem 1
Let $b \leq \frac{\sqrt{a}}{I_{1}(\sqrt{a})} \frac{\sqrt{2 l_{0}(\sqrt{a})-1}}{I_{0}(\sqrt{a})-1}$. The solution of $(1)$ is a positive, nonincreasing function $f$ for which we have

$$
A h_{1} \leq h \leq h_{0}
$$

where $h_{0}$ is defined by the formula

$$
h_{0}(r):=\frac{b}{a}\left(1-\frac{l_{0}(\sqrt{a} r)}{I_{0}(\sqrt{a})}\right)
$$

and $h_{1}$ is the next approximation in the successive approximation scheme. Moreover,

$$
A=\sqrt{\frac{1+h_{0}^{\prime}(1)^{2}}{1+\left(2-\frac{1}{l_{0}(\sqrt{a})}\right) h_{0}^{\prime}(1)^{2}}}
$$

## Inverse problem

## How to find $a$ and $b$ when we know $h$ ?

- Problems of this kind are usually ill-posed, that is they do not fulfill one of the following conditions
$\square$ they have a solution,
$\square$ they have an unique solution,
$\square$ small error in the initial data causes small error in the output (stability).


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- In our case we consider two problems:

1. $a \mathrm{i} b$ are constant and unknown $\rightarrow$ nonlinear problem,
2. $a$ is known and constant but $b$ (not necessarily constant) has to be found $\rightarrow$ linear problem.

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- Remark: We cannot hope for an unique solution - we look for a solution in the $L^{2}$ norm sense (least-squares).


## The nonliear inverse problem ( $a, b$ constant and unknown)

In subsequent considerations we will assume that the curvature of the cornea is small. It simplifies the equation

$$
-\frac{1}{r} \frac{\partial}{\partial r}\left(r \frac{\partial h}{\partial r}\right)+a h=b, \quad h^{\prime}(0)=1, \quad h(1)=0 .
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19 〔20] W.Okrasiński, Ł.Płociniczak, Nonliear Parameter Identification in Corneal Geometry Model

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- The nonlinear problem can be solved in a two-step method [10] :

1. First, using the general theory we find

$$
b^{\dagger}=b^{\dagger}(a)=\frac{\langle f(a, \cdot), h\rangle}{\|f(a, \cdot)\|^{2}},
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where $f(a, r):=\frac{b}{a}\left(1-\frac{l_{0}(\sqrt{ }) r}{l_{0}(\sqrt{a})}\right)$.

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where $f(a, r):=\frac{b}{a}\left(1-\frac{l_{0}(\sqrt{a} r)}{l_{0}(\sqrt{a})}\right)$.
2. Then, we solve a nonlinear problem of fining $a$. We use an iterative method similar to the Newton's tangent scheme (a new proof of convergence)

$$
a_{n+1}=a_{n}+\Delta a_{n}, \quad \Delta a_{n}=\frac{\left\langle h-f\left(a_{n}, \cdot\right), \frac{\partial}{\partial a} b^{\dagger}(a) f(a ; \cdot)\right\rangle}{\left\|\frac{\partial}{\partial a} b^{\dagger}(a) f(a ; \cdot)\right\|^{2}}
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## The linear inverse problem ( $a$ constant and known, $b$ unknown)

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-\frac{1}{r} \frac{\partial}{\partial r}\left(r \frac{\partial h}{\partial r}\right)+\frac{1}{r^{2}} \frac{\partial^{2} h}{\partial \theta^{2}}+a h=b,\left.\quad h\right|_{\partial \Omega}=0
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where $\partial \Omega$ is an unit circle.

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- We use eigenfunctions [9] $\Phi_{n m}(r, \theta):=\frac{1}{\sqrt{4 \pi}} \frac{I_{n}\left(\mu_{n m} r\right)}{n_{n+1}\left(\mu_{n m}\right)} e^{i n \theta}$, where $\mu_{n m}$ is $m$-th zero of $I_{n}$ ( $n$th order modified Bessel function of the first kind).


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- Remark: $a-\mu_{n m}^{2} \rightarrow \infty$, which destroys stability: small error in $h$ will cause the series to become divergent.


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$$

where $\partial \Omega$ is an unit circle.

- We use eigenfunctions [9] $\Phi_{n m}(r, \theta):=\frac{1}{\sqrt{4 \pi}} \frac{I_{n}\left(\mu_{n m} r\right)}{I_{n+1}\left(\mu_{n m}\right)} e^{i n \theta}$, where $\mu_{n m}$ is $m$-th zero of $I_{n}$ ( $n$th order modified Bessel function of the first kind).
- A solution of the inverse problem $b^{\dagger}=\sum_{n, m}\left(a-\mu_{n m}^{2}\right)\left\langle h, \Phi_{n m}\right\rangle \Phi_{n m}$.
- Remark: $a-\mu_{n m}^{2} \rightarrow \infty$, which destroys stability: small error in $h$ will cause the series to become divergent.
- A regularization is neccessary

$$
b_{\alpha, T(N, M)}:=\sum_{\substack{n=-N, m=1}}^{N, M} \frac{\left\langle h, \Phi_{n m}\right\rangle}{\alpha+\frac{1}{a-\mu_{n m}^{2}}} \Phi_{n m}
$$

The linear inverse problem ( $a$ constant and known, $b$ unknown) cont'd.

How much $b_{\alpha, T}^{\delta}$ is different from the true value $b$ ? (If $\left\|h^{\delta}-h\right\| \leq \delta$ ).
Theorem 2
We have

$$
\left\|b_{\alpha, T(N, M)}^{\delta}-b\right\| \leq 2 \sqrt{D \delta}
$$

if only $\alpha=\alpha(\delta), N=N(\delta), M=M(\delta)$ are chosen, as to

$$
\alpha+C(N, M)=\sqrt{\frac{\delta}{D}}
$$

where $\|y\| \leq D$ and $C(N, M):=\inf \left\{\frac{1}{a-\mu_{n m}^{2}}:|n| \leq N, m \leq M\right\}$.

## Numerics




Fitting errors, with $a_{0} i$ $b_{0}$ constant.

$\beta$, where $b=b_{0}+\beta$.
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## Summary

- Mathematical modeling in problems associated with eye is very desired.
- It is a source of very interesting and nontrivial problems from different fields on mathematics.
- Further progress in medicine will be very dependent on mathematics.
- We obtained a new, easy to apply, model of corneal topography based on physical principles.
- We have presented a new and fast iterative method of determining unknown parameters in the inverse problem.
$\square$ Methods of finding $a$ and $b$ guarantee good model fitting (with small error).
$\square$ Coefficients $a$ and $b$ are associated with measurable parameters of the cornea, and thus can be important in diagnosis and treating eye diseases.
$\square$ The function $\beta$ contains information about lack of axial symmetry of the cornea.


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